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(54) **REGULATING SERVER LOAD BY VARYING  
SIZES OF DATA SETS USED TO GENERATE  
CONTENT**

29/08072 (2013.01); *H04L 67/1002* (2013.01);  
*H04L 67/1008* (2013.01);

(Continued)

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(58) **Field of Classification Search**

CPC ..... *H04L 67/32*; *G06F 9/50*

USPC ..... 709/219

See application file for complete search history.

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patent is extended or adjusted under 35  
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Web Server Qos," pp. 1-37, dated Apr. 6, 2000 (of-record in parent  
application).

**Related U.S. Application Data**

(60) Continuation of application No. 12/013,935, filed on  
Jan. 14, 2008, now Pat. No. 8,539,019, which is a  
division of application No. 10/390,067, filed on Mar.  
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Bear, LLP

(60) Provisional application No. 60/400,079, filed on Jul.  
31, 2002.

(57) **ABSTRACT**

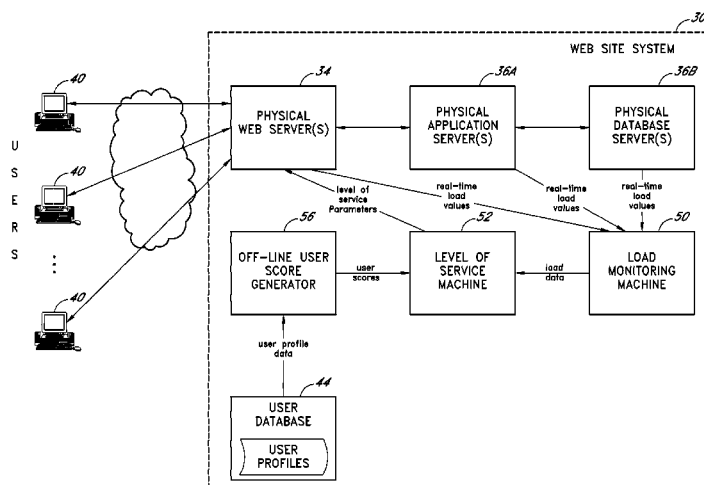
A system regulates server load by dynamically selecting vari-  
ables that directly or indirectly control the type and/or quan-  
tity of processing performed in responding to content  
requests, such as requests for dynamically generated web  
pages. For example, the system may use current load level  
data to vary the sizes of input data sets used to generate  
personalized recommendations or other content for users.

(51) **Int. Cl.**  
*H04L 29/08* (2006.01)  
*G06F 9/50* (2006.01)

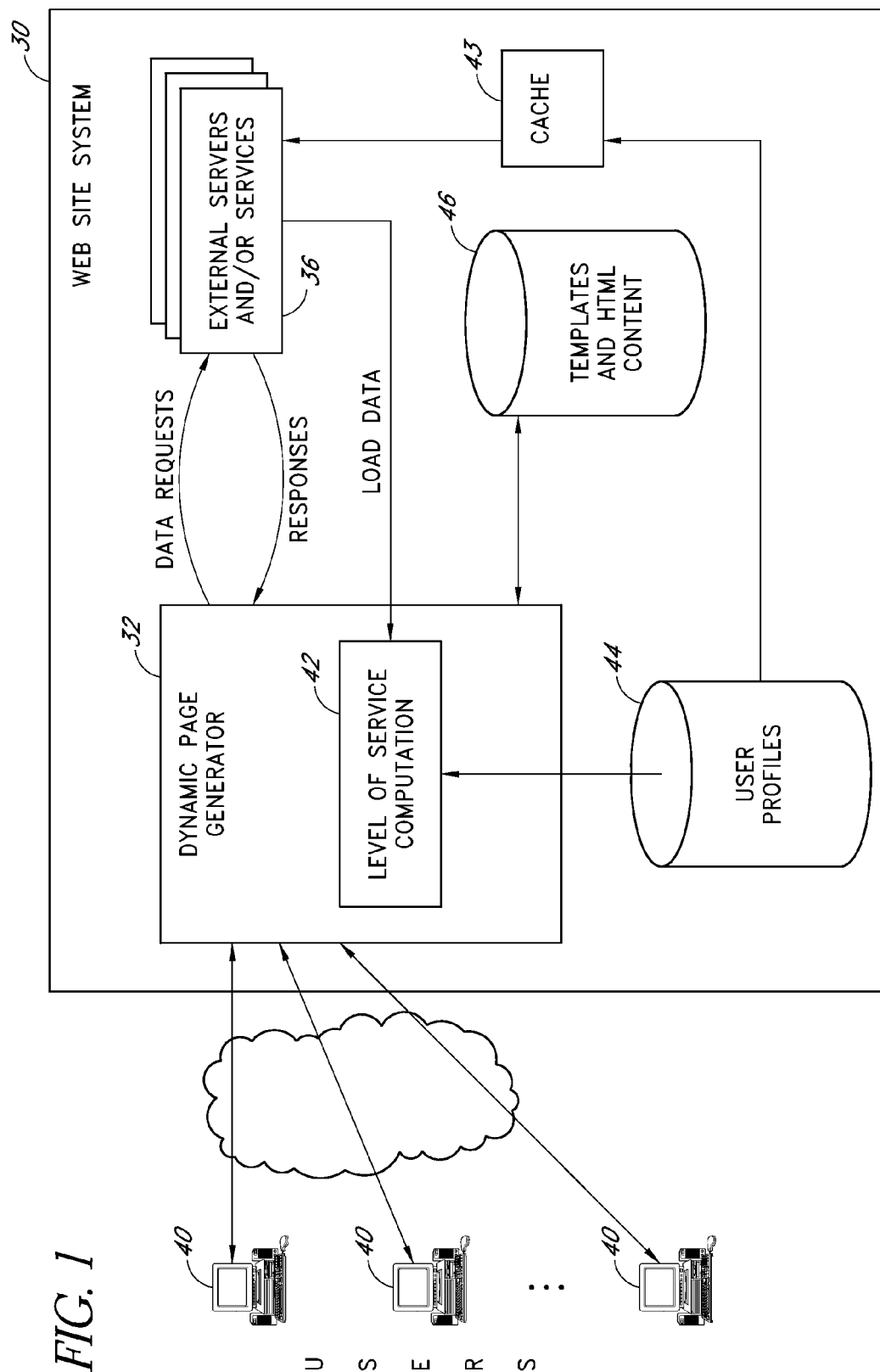
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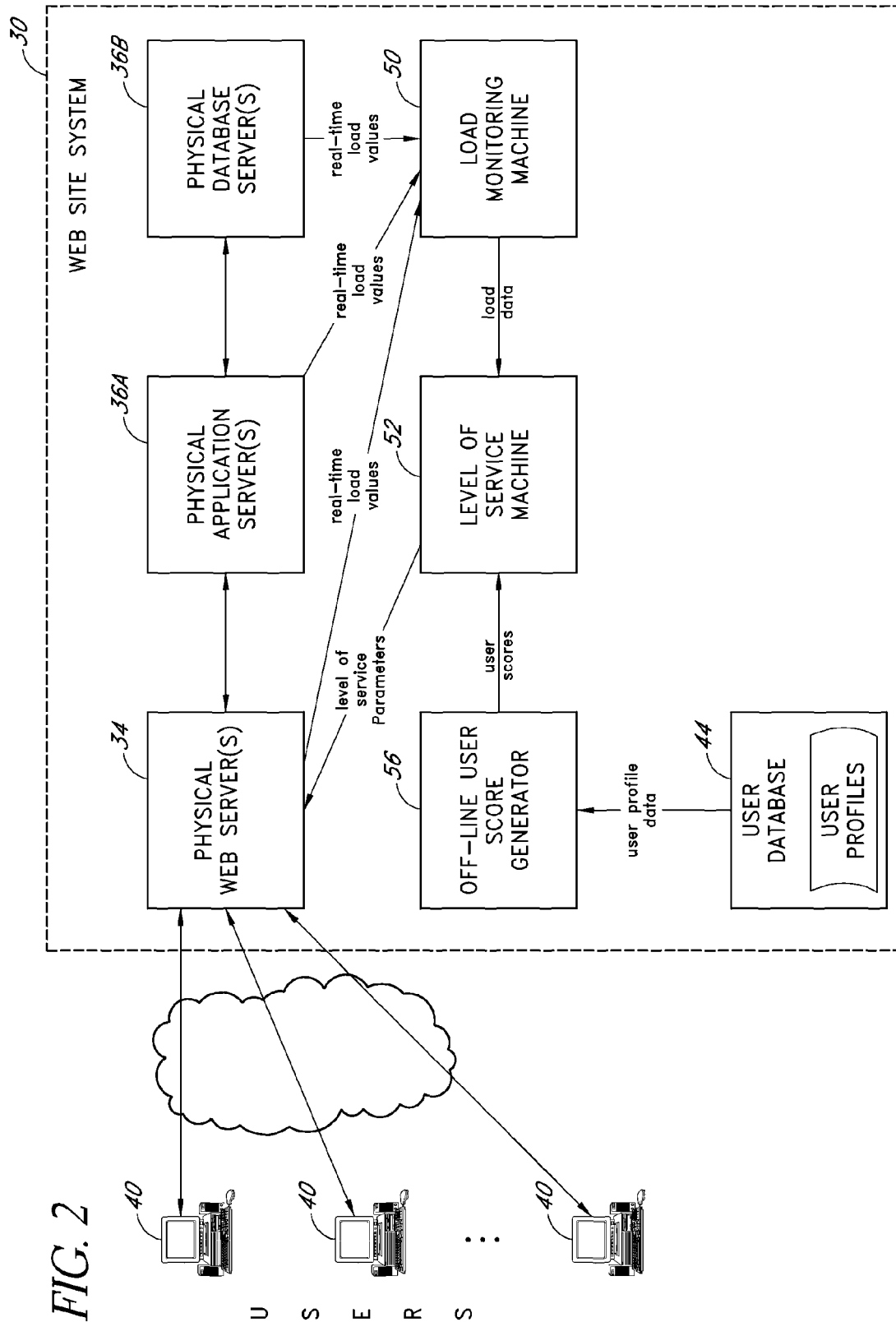
(52) **U.S. Cl.**  
CPC *H04L 67/32* (2013.01); *G06F 9/50* (2013.01);  
*G06F 9/505* (2013.01); *G06F 17/3089*  
(2013.01); *G06Q 30/0601* (2013.01); *H04L*

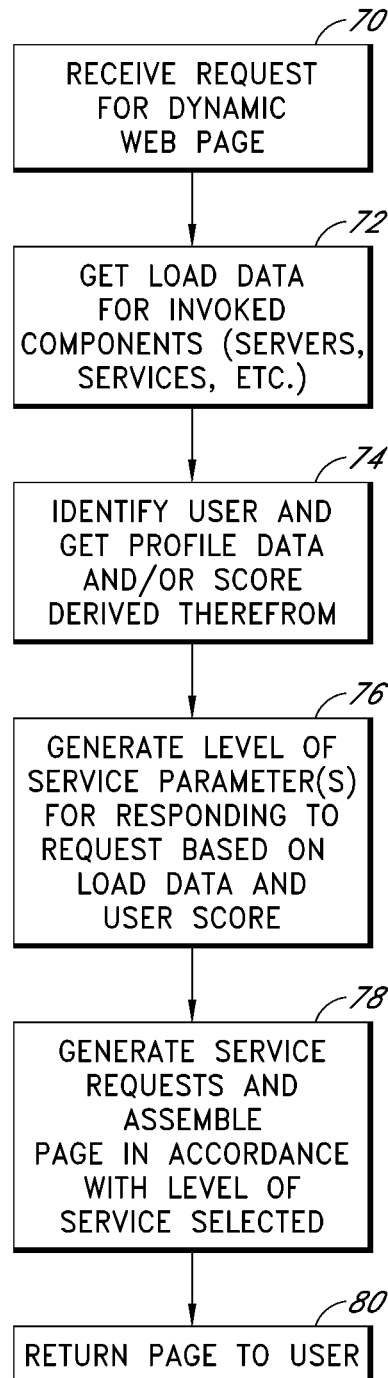
**20 Claims, 4 Drawing Sheets**

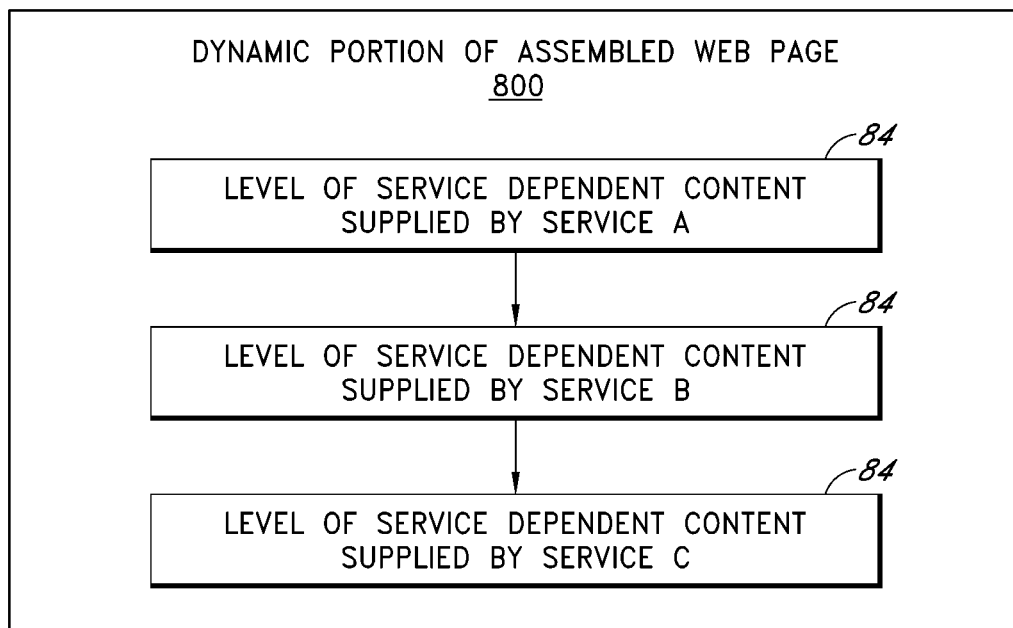


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6,823,380 B1 \* 11/2004 Nace ..... H04L 41/145
- (52) **U.S. Cl.** CPC ..... **H04L 67/1012** (2013.01); **H04L 67/306** 2002/0019843 A1 \* 2/2002 Killian ..... G06F 9/465  
(2013.01); **H04L 69/329** (2013.01) 718/102
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*FIG. 3*

*FIG. 4*

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## REGULATING SERVER LOAD BY VARYING SIZES OF DATA SETS USED TO GENERATE CONTENT

### PRIORITY CLAIM

This application is a continuation of U.S. application Ser. No. 12/013,935, filed Jan. 14, 2008, which is a division of application Ser. No. 10/390,067, filed Mar. 14, 2003, which claims the benefit of U.S. Provisional Appl. No. 60/400,079, filed Jul. 31, 2002. The disclosures of the aforesaid applications are hereby incorporated by reference.

### BACKGROUND

#### 1. Technical Field

This invention relates to systems and methods for managing load levels of web server systems that generate and personalize web pages dynamically.

#### 2. Description of the Related Art

The term "load" is commonly used to describe how much of a computing device's or system's resources are being used. These resources can include, for example, processing capacity, random access memory, incoming and outgoing communication bandwidth, and/or disk input/output (I/O) capacity. Operating systems commonly generate a number of different parameters indicative of the current load on a system.

A high load on a computing device typically means that some or all of the resources are being fully or almost fully utilized. A low load typically means that there are sufficient resources available to handle additional tasks. As the load on a computing device increases, performance in handling tasks generally suffers. When load exceeds certain critical levels, response times can degrade precipitously.

A web site is typically hosted on a server system which can include one or more computing devices. A low traffic web site, for example, can typically be hosted on a single server computer. A very high traffic web site, for example, will typically include multiple computing devices such as load balancing computers, web server computers, application server computers, and database server computers. The load on such a system can be specified in terms of the loads on the individual physical computing devices that make up the system.

The load on a web server system is affected by a number of factors, such as the number of web page requests being handled simultaneously, the rate at which new requests are being received, and the amount of processing and memory required to handle each request. In order to maintain acceptable user response times, well-maintained web sites have historically been hosted on systems that have sufficient excess capacity to handle peak loads. When the host system is lightly loaded, the excess capacity is unused.

In certain instances, the popularity of a web site increases unexpectedly, and the entity hosting the site does not have the ability (e.g. funds or time) to add server capacity to respond to the increasing loads. In these situations, the site's servers can become overloaded. As a result, wait times for requests can become unacceptable, and some requests may be dropped altogether without a response. When requests are dropped or when wait times become longer than several seconds, users' perceptions of a web site can be adversely affected.

In a paper titled "Reading Course Paper Overview of Internet QoS and Web Server QoS," (Department of Computer Science, The University of Western Ontario, London, Ontario, Canada, Apr. 6, 2000), Nikolaos Vasiliou surveys several application level systems designed to handle peak

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server loads when serving page requests. The systems surveyed generally propose varying the priority with which requests are handled in order to guarantee reasonable response times for high priority requests. Most of the systems described in the paper prioritize requests based on factors such as how much a web hosting customer is paying for the hosting of a requested web page. One of the systems prioritizes requests based upon the identity of the user requesting the page. These systems, however, end up favoring the high priority requests at the expense of lower priority requests. As a result, when loads increase, lower priority requests are more likely to be delayed or dropped.

Systems that address load problems solely by prioritizing some requests over others are unacceptable in certain contexts. For example, in many environments, long server response times and dropped page requests can result in a loss of customers. The present invention seeks to address this problem, among others.

### SUMMARY

A system is disclosed that regulates server load levels by varying one or more parameters that affect the quantity of processing resources used to dynamically generate content. For example, if system load is currently high, the system may limit the size of an input data set used by a personalization system or other component to generating content. In one embodiment, the system varies the type and quantity of processing performed in dynamically generating web pages.

Neither this summary nor the following detailed description is intended to define the invention. The invention is defined by the claims.

### BRIEF DESCRIPTION OF THE DRAWINGS

FIG. 1 illustrates the general software architecture of a system which regulates load levels according to one embodiment of the invention.

FIG. 2 illustrates an example system configuration that may be used to implement the system of FIG. 1.

FIG. 3 illustrates an example sequence of steps that may be performed by the dynamic page generator of FIG. 1 in response to a dynamic page request.

FIG. 4 illustrates the general arrangement of an example web page generated in accordance with the invention.

### DETAILED DESCRIPTION OF ILLUSTRATIVE EMBODIMENTS

#### I. Overview (FIGS. 1 and 2)

FIG. 1 illustrates a web site system 30 that embodies the invention. The system includes a dynamic page generator 32 that responds to page requests received from Internet users. The dynamic page generator 32 may run in-whole or in-part on a physical web server 34 (FIG. 2). The dynamic page generator 32 in the illustrated embodiment communicates with one or more services 36 that generate content incorporated into dynamic web pages. These services may, for example, include one or more recommendations engines that recommend items, such as products, to users based on the respective profiles of such users. Examples of recommendation engines and algorithms that may be used for this purpose are disclosed in U.S. Pat. No. 6,266,649 and published U.S. Patent Application Publication 2002/0198882 A1, the disclosures of which are hereby incorporated by references. The services 36 are preferably implemented as program modules

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that run on one or more physical servers. For example, each service may be implemented using a different respective server or set of servers. The dynamic page generator 32 may also access a repository 46 of web page templates and HTML content.

As further depicted by FIG. 1, as requests for dynamic web pages are received from user computers 40, the dynamic page generator 32 invokes a level-of-service computation module 42 to determine how to respond to such requests. As illustrated, this level-of-service module 42 may determine how to respond to a given request based on load data associated with the external services 36 or their servers. In addition, the level-of-service module may take into consideration data stored in a user profiles database 44, or user score values generated from such data.

The output of the level-of-service module 42 may be in any of a variety of forms. For example, this module 42 may generate a level-of-service score, such as a value between one and ten, that specifies a level of service to be provided to the user. This score value may then be passed to each service 36 invoked by the particular page request, which may in turn use the score to select the appropriate type and/or quantity of processing to be performed to generate the requested data. The level-of-service module 42 may additionally or alternatively select a web page template that specifies the type or types of dynamic content to be included in the response. Further, the level-of-service module 42 may additionally or alternatively generate one or more service parameters that specify or control the amount of processing that will be performed by a particular service 36 in responding to the request, as described below. Moreover, the level-of-service module 42 may additionally or alternatively determine the amount of and length of time that user data is cached in a cache memory 43. Regardless of the particular form, the output of this module 42 indirectly or directly specifies a level of service to be provided in responding to the page request.

The levels of service are preferably dynamically selected or varied such that the quantity of processing resources used to respond to a request for a given page is generally inversely proportional to the current load level(s) of the invoked component(s) or of the system as a whole. The system in FIG. 1 thus operates in a feedback configuration, reducing the amount of processing performed during heavy load conditions and increasing the amount of processing performed during light load conditions. Preferably, the levels of service are varied so as to maintain response times for all users at an acceptable level, with very little or no need to drop page requests.

FIG. 2 illustrates one example of how the above-described functions may be assigned to physical machines. In this example, the web site system 30 includes one or more physical web servers 34, one or more physical application servers 36A, and one or more physical database servers 36B, all of which communicate over a local area network. The system also includes a load monitoring machine 50 that polls each physical web server 34, application server 36A and database server 36B to obtain real time load values. The real time load values may include various server resource parameters commonly generated by Unix and/or Windows operating systems, and may be requested using application program interfaces (APIs) provided by these operating systems.

Real time load data collected by the load monitoring machine 50 is reported to a level of service machine 52, optionally in an aggregated form in which the loads of multiple machines are appropriately averaged. The level of service machine 52 in this example also receives user score values generated by an off-line user score generator module

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56, which may run on any appropriate machine. The user score generator 56 may alternatively be omitted, in which case levels of service may be based solely on load data.

In one embodiment, the user score generator 56 periodically generates a separate score for each user of the system by analyzing the browsing and/or purchase histories of the users. A user's score may, for example, be based on one or more of the following: (a) the amount of time spent by the user browsing the web site, (b) the quantity of transactions conducted by the user on the web site, (c) the length of time since the user set up an account on the web site (d) the user's connection speed. The scores may be generated or updated at any appropriate time, such as when a user finishes a browsing session or completes a transaction. Although the user scores are shown as flowing directly from the user score generator to the level of service machine 52, they may actually be read from the user database 44 as needed to respond to page requests, or may be extracted from browser cookies transmitted with such requests.

The level of service machine 52 generates level of service parameters based on the load data and (preferably) the user scores, as described above, and reports these parameter values to the web servers 34. Preferably, each parameter value or set of parameter values corresponds to a particular page request, and directly or indirectly specifies the amount of processing to be performed in responding to that request. However, in some embodiments, these parameter values may alternatively specify how the web servers 34 should respond to a particular class of request. For example, the level of service machine 52 may instruct the web servers 34 to temporarily disable personalized ranking of search results for all users, or for all users whose score falls below a particular threshold.

## II. Example Methods for Limiting Utilization of Processing Resources

One particular method that may be used to control the amount of processing resources used in responding to page requests involves controlling the size of an input data set used to generate personalized page content. For example, in one embodiment, a recommendations service of the type described in U.S. Pat. No. 6,266,649, referenced above, is used to generate personalized recommendations of items, such as products represented in a database. To generate these recommendations, the recommendations service maps an input data set of items that are "known" to be of interest to the user (e.g. those the user has viewed or purchased) to a set of additional items that are deemed likely to be of interest to the user. The amount of processing performed to identify these additional items is directly proportional to the size of the input data set (i.e., the set of "items of known interest"). The recommendations are generated on-the-fly in response to page requests, and are incorporated into the requested web pages.

In accordance with the invention, the quantity of processing performed by the recommendations service is controlled, on a page request by page request basis, by selectively limiting the size of the set of items of known interest used to generate the personalized recommendations. For example, when the server system is lightly loaded, the entire purchase history of a user may be used to generate the personalized recommendations. When, on the other hand, the system is heavily loaded, the recommendations may be generated based solely on the last N (e.g., 5) items purchased by the user, even though the user's purchase history may include a much larger number of items. The value of N may be selected dynamically based on the load of the web server system as a



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whole, based on the load on the recommendations service, and/or based on information about the particular user. Thus, regardless of the load level, the user is provided with personalized item recommendations, although these recommendations may be based on a relatively small amount of information about the user during heavy load conditions. Recommendations provided during high load conditions may therefore be less tailored or less accurate than recommendations provided during low load conditions.

The amount of processing performed by a search engine or service in response to user-submitted search queries can similarly be controlled. For example, in one embodiment, a product search engine of the web site system ranks search results based on information known about the user, such as the user's purchase history. The goal of this ranking, in one embodiment, is to more prominently display those products that are the most similar to items the user has purchased. An example of a search engine system that uses information about the user (as well as other types of information) to rank search results is described in U.S. Pat. No. 6,185,558. As with the recommendations service example above, the amount of processing performed to generate the personalized ranking may be selectively controlled by limiting the amount of user profile information incorporated into the ranking process. For instance, during heavy load conditions, only a small subset of the user's purchase history may be incorporated into the ranking process, while during light load conditions the user's entire purchase history may be used.

The amount of processing performed by a web server system 30 may also be controlled by effectively turning on and off certain types of services. For example, U.S. Pat. No. 6,144,958 describes a spell checking service used to check the spellings of search terms in search queries; and U.S. Pat. No. 6,006,225 describes a service for suggesting additional search terms to users to assist these users in refining their queries. One or both of these services may be selectively turned off during heavy load conditions, and/or in response to requests from certain classes of users, to reduce the processing load associated with responding to search query submissions. The disclosures of the aforesaid patents are hereby incorporated by reference.

In all of the examples provided above, web pages with meaningful content are always provided to the user (during error-free operation), but according to different levels of service. That is, all or nearly all of the web pages will contain the same type of content, but the amount of processing used to generate the content will vary inversely to the load on the system generating the web pages.

### III. Process Flow (FIGS. 3 and 4)

FIG. 3 illustrates one example of a sequence of steps that may be performed by the dynamic page generator 32 of FIG. 1 to respond to dynamic page requests in accordance with the invention. In response to receiving a dynamic page request from a user (block 70), the dynamic page generator 32 obtains the load data associated with the component or components ordinarily invoked by the request (block 72). For example, if the request is for a page that ordinarily includes personalized recommendations, load data associated with the corresponding recommendations service—or a server on which this service runs—may be obtained. If multiple components 36 are invoked, the load data associated with each such component may be obtained.

The dynamic page generator 32 also identifies the user (typically using a browser cookie transmitted with the page request), and retrieves a profile of the user and/or a user score

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derived from the user's profile (block 74). If no score exists for the user, the user's profile data may be used to generate a score on-the-fly, or a default score may be used. As depicted by block 76, the dynamic page generator 32 uses the load data and the user score to generate one or more level-of-service parameters for responding to the request (block 78). The level of service parameter(s) may include one or more of the following, and may depend upon the particular URL requested: (1) an identifier of a web page template to be used; (2) a general level-of-service value that applies to all components, (3) separate level-of-service values for specific components or sets of components, (4) one or more depth-of-processing values indicating, e.g., a size of an input data set (such as a set used to generate personalized content), or (5) an indication of specific services or features to be disabled for purposes of generating personalized content.

As depicted by block 78, the dynamic page generator 32 generates service requests to one or more services 36 in accordance with the level-of-service parameter(s) generated in block 76. The data returned by the service or services 36 is then assembled into a dynamic web page, and the web page is returned to the user (block 80).

Although the process shown in FIG. 3 uses separate load data for each invoked component, the levels of service may be based in-whole or in-part on load data reflective of the current load on the web site system as a whole. In addition, although the level-of-service parameters in this example depend upon the identity of the user, they may alternatively be generated without regard to user identity.

Further, the task of selecting levels of service may be performed by the services themselves rather than by a centralized level of service module or computer. For example, in one embodiment, each service has its own respective level-of-service module 42 which may run on a particular server of that service. When a request is passed to such a service, the service (through its own level-of-service module 42) selects an appropriate level of service based on its own load level (and optionally the user's identity), and responds to the request accordingly. Thus, rather than having a central server that dictates the processing for each page, each of the services makes its own level-of-service determinations.

FIG. 4 illustrates the general form of a web page that may be generated according to the process of FIG. 3. In this example, the web page includes three dynamic content sections 84, each of which contains content generated by a different respective service 36. The particular selection of content sections 84 used to respond to a given URL request may depend upon the particular template selected, which may in-turn depend upon the current load levels of the various components or services 36 within the system. In addition, the content included within each section 84 may depend upon the level-of-service parameters associated with the page request. For example, for a content section 84 that includes purchase-history-based recommendations, the recommendations may be based on the entire purchase history of the user if the associated load levels are currently low, and may be based on a subset of this purchase history if load levels are currently high.

As discussed above, the level of service determination or feedback procedure preferably takes into account current system load levels in determining a level of service. Available system memory and available processing capacity are two load factors that may be considered. Another load factor that can be taken into account is a rate at which new web page requests are being received. The rate can be used as a rough measure of the amount of computing resources that can be allocated to responding to each request. In one embodiment,

the available resources (e.g. processing cycles per second) can be divided by the rate of receipt (e.g., requests per second) to determine the amount of resources that can be allocated to serving each page without overloading the system.

#### IV. Data Caching Policies

Personalized content is commonly generated based on user profile data read from a database. To reduce the need to access such a database, some or all of a user's profile data may be maintained in a server system's non-volatile random access memory. Since a server system generally will not have enough random access memory to hold all of the data of all users in its memory, a caching policy is typically used. For example, a user's profile may be retrieved from a database and cached when first needed, and may later be overwritten in the cache memory according to a least-recently-used deletion policy. As a result of the caching policy, a user's first page request after a long period of inactivity may be substantially delayed by the time it takes to retrieve the user's data from a database.

In accordance with one embodiment, the external servers/ and or services 36 vary their caching policy from user-to-user based on the profile of each user, or the user score generated therefrom. For example, for a relatively heavy user of the system, a service or server may do one or more of the following (1) keep a greater quantity of the user's purchase history, browsing history, or other profile data in cache memory (i.e., vary the amount of cache dedicated to a user); or (2) keep the user's profile data in cache memory for a longer period of time (e.g., for several hours or days) since the user's last access to the system, relative to the amount of time used for other users of the system. The servers and/or services 36 may additionally vary their caching policies based on current load data.

Although the invention has been described in terms of certain embodiments, other embodiments that will be apparent to those of ordinary skill in the art, including embodiments which do not provide all of the features and advantages set forth herein, are also within the scope of this invention. Accordingly, the scope of the invention is defined by the claims that follow.

What is claimed is:

1. A computer-implemented method of regulating server load levels, comprising:

receiving a content request generated by a user device;  
determining a load level associated with a content generation system responsible for dynamically generating content associated with the request, said content generation system comprising at least one server;

in response to the content request, selecting, based at least partly on the determined load level associated with the content generation system, a size of an input data set to use to generate the content;

causing the content generation system to generate the content using an input data set of the selected size, wherein the size of the input data set affects a quantity of processing resources used by the content generation system to generate the content; and

transmitting the generated content to the user device;  
said method performed automatically by a computer system.

2. The method of claim 1, wherein selecting the size of the input data set comprises selecting an input data set size that is inversely proportional to the load level of the content generation system.

3. The method of claim 1, wherein the size of the input data set is selected based additionally on a user score associated with the content request.

4. The method of claim 1, wherein the content comprises personalized content.

5. The method of claim 4, wherein selecting the size of the input data set comprises determining a quantity of user profile data to use to generate the personalized content.

6. The method of claim 1, wherein the content comprises personalized recommendations, and wherein selecting the size of the input data set comprises determining a quantity of user profile data to use to generate the personalized recommendations.

7. The method of claim 1, wherein the content generation system is a search engine system.

8. The method of claim 7, wherein selecting the size of the input data set comprises determining a quantity of user profile data to be used by the search engine system to personalize search results for a user.

9. The method of claim 1, wherein the computer system is separate from the content generation system.

10. The method of claim 1, wherein the method is performed at least partly by the content generation system.

11. The method of claim 1, wherein the content request is a page request.

12. Non-transitory computer storage having stored thereon executable code that directs a computer system to perform a process that comprises:

determining, in response to receiving a content request, a load level associated with a content generation system that dynamically generates content associated with the content request, said content generation system comprising at least one server;

in response to the content request, selecting, based at least partly on the determined load level associated with the content generation system, a size of a data set to use to generate the content; and

causing the content generation system to generate the content using a data set of the selected size;

wherein the size of the data set affects a quantity of processing resources used by the content generation system to generate the content, such that a load placed on the content generation system is regulated by selecting the size of the data set.

13. The non-transitory computer storage of claim 12, wherein the size of the data set is selected to be inversely proportional to the determined load level.

14. The non-transitory computer storage of claim 12, wherein the size of the data set is selected based additionally on a user score associated with the content request.

15. The non-transitory computer storage of claim 12, wherein the content comprises personalized content.

16. The non-transitory computer storage of claim 15, wherein selecting the size of the data set comprises determining a quantity of user profile data to use to generate the personalized content.

17. The non-transitory computer storage of claim 12, wherein the content comprises personalized recommendations, and selecting the size of the data set comprises determining a quantity of user profile data to use to generate the personalized recommendations.

18. A system capable of regulating server load, the system comprising:

a content generation system comprising at least one machine, the content generation system responsive to content requests by dynamically generating and returning responsive content that is based on input data sets,

wherein a quantity of processing performed by the content generation system is dependent upon the sizes of the input data sets;

a load monitoring system that monitors a load level associated with the content generation system, the load monitoring system comprising a physical machine; and  
a load regulation system that varies the sizes of the input data sets based at least partly on the load level associated with the content generation system, said load regulation system thereby regulating said load level, the load regulation system comprising a physical machine.

**19.** The system of claim **18**, wherein the load regulation system is a component of the content generation system.

**20.** The system of claim **18**, wherein the load regulation system additionally varies the sizes of the input data sets based on information regarding users associated with the content requests.

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